SIGGRAPH +202+



# Gradient Domain High Dynamic Range Compression

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## High Dynamic Range Scenes





1/500









1/60









1/30 1/15 1/8 1/4

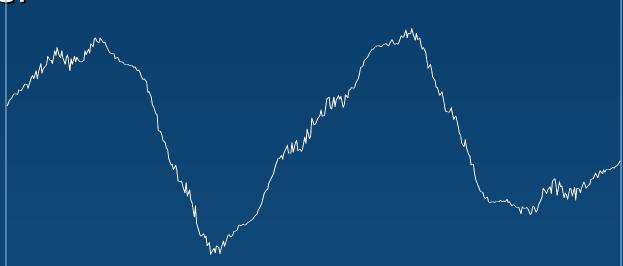


## High Dynamic Range Images

 Large ratio between brightest and darkest intensities in the image.

 Small magnitude, local variations in intensity are present across the entire

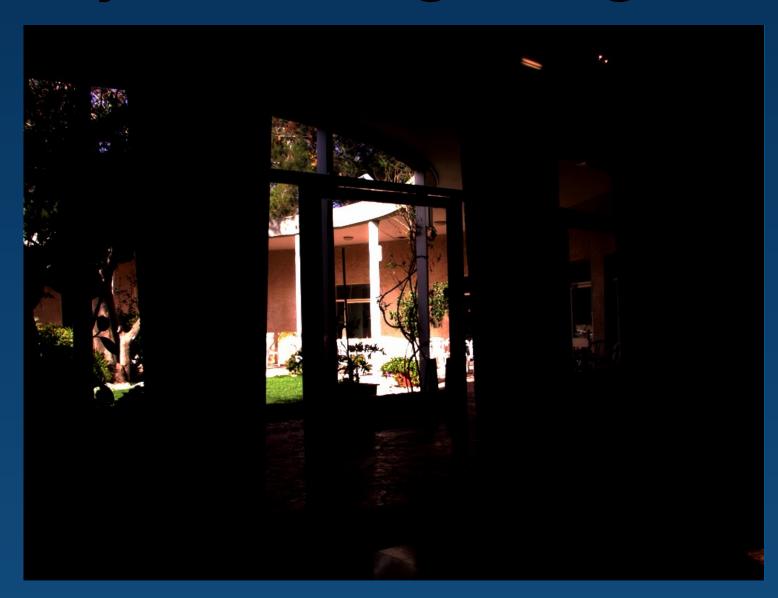
range:





## High Dynamic Range Images







# Where do they come from?

Physically-based illumination simulations.

- Digital photography:
  - Combining several differently exposed LDR images into a single HDR image (Debevec & Malik 1997).
  - HDR panoramic video mosaics (Schechner & Nayar 2001).
  - HDR digital cameras.

# Goal

 Compression of dynamic range to enable rendering HDR images on LDR devices.

- Desirable features:
  - Avoid large over/under exposed regions.
  - Preserve visibility of fine details (local contrasts).
  - Avoid introducing artifacts to the image.

# \* Previous Work

- Spatially invariant tone mapping operators
  - Image-independent curves:
    - Linear scaling, Gamma correction, logarithmic mappings...
  - Image-dependent curves:
    - Histogram equalization
    - Visibility matching tone reproduction (Ward et al. 97)
- Problem: monotonic mapping leads to loss of local contrast!



## Example: Ward et al 1997







# \* Previous Work

- Spatially variant tone mapping operators
  - Homomorphic filtering (Stockham 72, Horn 74).
  - Retinex-based operators (Jobson et al. 97)
  - Adaptive histogram equalization (Pizer et al. 87)
  - Multi-scale operators (Pattanaik et al. 98)

Problem: "halo" artifacts



## Example: multi-scale operator



# **Previous Work**

- LCIS Low Curvature Image Simplifier (Tumblin & Turk 99)
  - Drastic range compression
  - Preservation of visible detail

- Problems:
  - Slow
  - Weak halos, detail over-emphasis



# **Example: LCIS**





# Our Approach - Overview

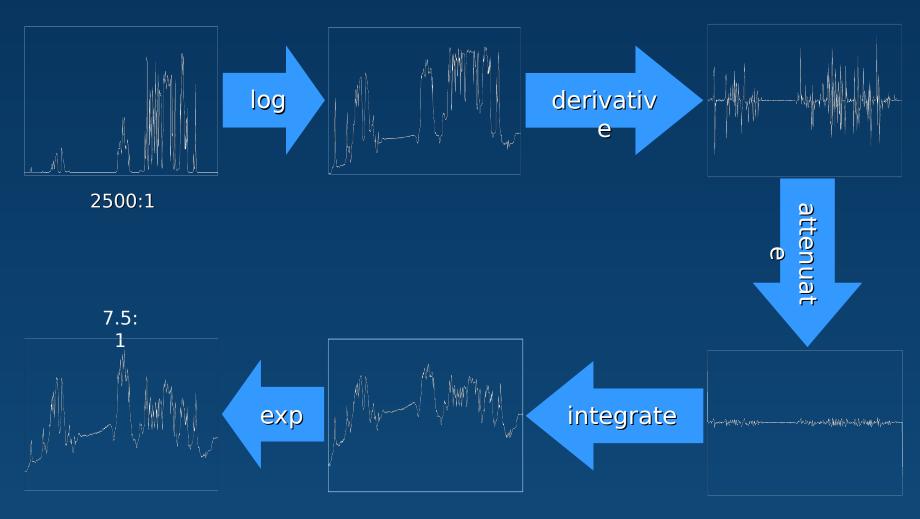
### Observations:

- High dynamic range results from strong luminance changes
- Absolute change magnitude is not important

### Method:

- Examine gradients to identify luminance changes
- Attenuate high luminance gradients
- Reconstruct a low-dynamic range image

# The Method in 1D



# The Method in 2D

- Given: a log-luminance image H(x,y)
- Compute an attenuation map (NH)
- Compute an attenuated gradient field G:

$$G(x,y) = \tilde{N}H(x,y) \times (\|\tilde{N}H\|)$$

Problem: G is not integrable!

# Solution

• Look for image I with gradient closest to G in the least squares sense.

• I minimizes the integration V(NI,G) V(NI,G)

$$F(\nabla I,G) = \|\nabla I - G\|^2 = \left\|\frac{\partial I}{\partial x} - G_x\right\|^2 + \left\|\frac{\partial I}{\partial y} - G_y\right\|^2$$

# Euler-Lagrange Equation

• I must satisfy: 
$$\frac{\partial F}{\partial I} - \frac{d}{dx} \frac{\partial F}{\partial I_x} - \frac{d}{dy} \frac{\partial F}{\partial I_y} = 0$$

Substituting F we get:

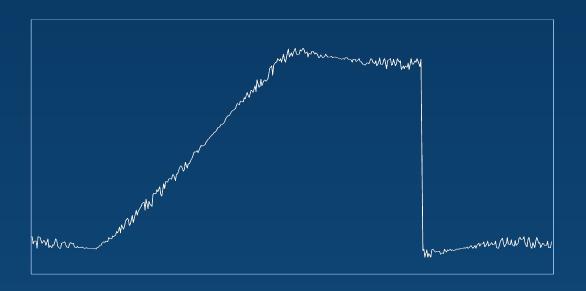
$$2\frac{\partial^2 I}{\partial x^2} + \frac{\partial G_X^2 I}{\partial y^2} = 2\frac{\partial^2 I}{\partial y^2} + \frac{\partial G_Y^2 I}{\partial y^2} = 0$$

$$\nabla^2 I = \operatorname{div} G$$



## **Gradient Attenuation**

 Strong luminance changes may occur at different rates:



Must examine gradients at multiple scales!



# Multiscale Gradient Attenuation



















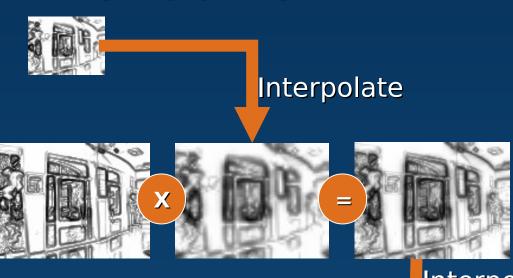
log(Luminance)

Gradient magnitude

Attenuation map

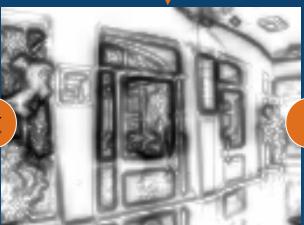


# Multiscale Gradient Attenuation



Interpolate









# Final Gradient Attenuation Map



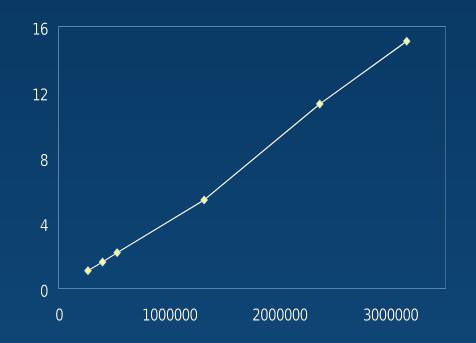


## **Performance**

• Measured on 1.8 GHz Pentium 4:

• 512 x 384: 1.1 sec

• 1024 x 768: 4.5 sec



 Can be accelerated using processor-optimized libraries.



## Results (Ward et al. 1997)





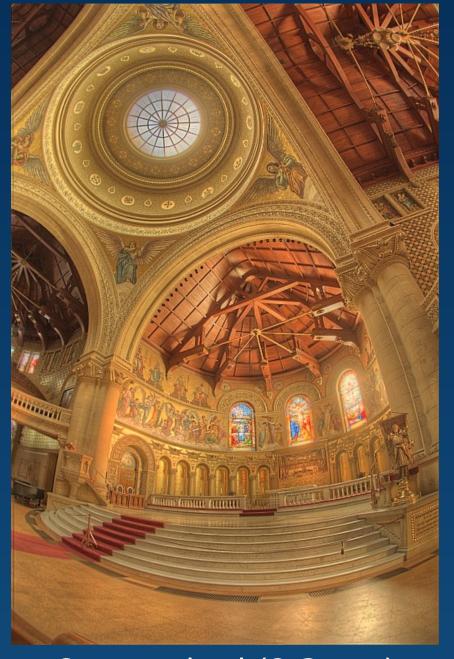
## Results (LCIS)





## Results (our method)





Our method (2.3 sec)

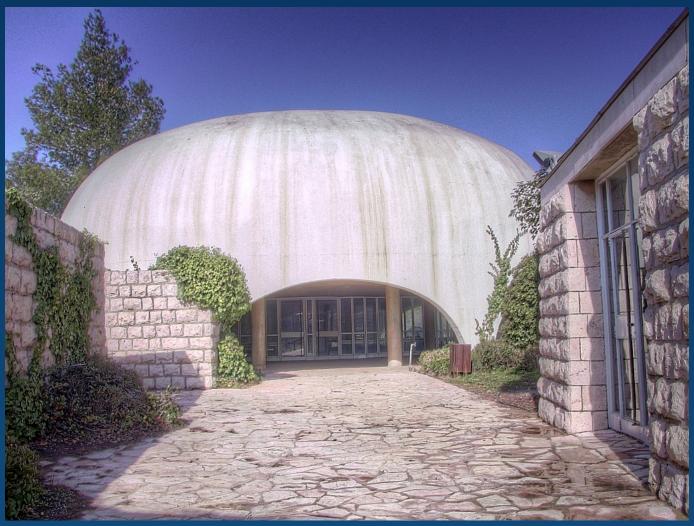
LCIS (4 min)

















# Summary

- New method for detail-preserving compression of dynamic range.
- Also useful for enhancing ordinary images.

- Future work:
  - Better handling of color
  - Incorporate psychophysical properties of the HVS
  - Explore other applications of gradient field manipulations.



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